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Split and migrate: Resource-driven placement and discovery of microservices at the edge

Genc Tato

Univ Rennes, Inria, CNRS, IRISA, France

Marin Bertier

Univ Rennes, Inria, CNRS, IRISA

INSA Rennes, France

Etienne Rivière

UCLouvain, Belgium

Cédric Tedeschi

Univ Rennes, Inria, CNRS, IRISA, France

Abstract

Microservices architectures combine the use of fine-grained and independently-scalable services with lightweight communication protocols, such as REST calls over HTTP. Microservices bring flexibility to the development and deployment of application back-ends in the cloud.

Applications such as collaborative editing tools require frequent interactions between the front-end running on users' machines and a back-end formed of multiple microservices. User-perceived latencies depend on their connection to microservices, but also on the interaction patterns between these services and their databases. Placing services at the edge of the network, closer to the users, is necessary to reduce user-perceived latencies. It is however difficult to decide on the placement of *complete* stateful microservices at one specific core or edge location without trading between a latency reduction for some users and a latency increase for the others.

We present how to dynamically deploy microservices on a combination of core and edge resources to systematically reduce user-perceived latencies. Our approach enables the split of stateful microservices, and the placement of the resulting splits on appropriate core and edge sites. Koala, a decentralized and resource-driven service discovery middleware, enables REST calls to reach and use the appropriate split, with only minimal changes to a legacy microservices application. Locality awareness using network coordinates further enables to automatically migrate services split and follow the location of the users. We confirm the effectiveness of our approach with a full prototype and an application to ShareLatex, a microservices-based collaborative editing application.

2012 ACM Subject Classification Information systems → Distributed storage; Information systems → Service discovery and interfaces; Computer systems organization → Cloud computing

Keywords and phrases Distributed applications, Microservices, State management, Edge computing

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1 Introduction

Modern interactive applications combine a front-end running on client devices (e.g. in their web browser) with a back-end in the cloud. Collaborative *editing* applications, in which multiple users concurrently make changes to the same document, such as Google Docs, Microsoft Office 365, and ShareLatex, are good examples of such interactive applications. Quality of experience for users of such applications depends on low latencies between an action of one client and its visibility by other clients.

A solution to enable fast request-response latencies between the front-end and the back-end of a collaborative application is to deploy part of the back-end at the edge, i.e. on computing resources that are closer and accessible with low latencies from the front-end.



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It is often challenging to adapt an application to make use of edge resources. Software monoliths typically require massive re-engineering to support a deployment on multiple sites, as they base the collaboration between their constituents on shared memory or common databases. Service-Oriented Architectures (SOAs) on the other hand present desirable features for this adaptation, by splitting the features of the application into independent services and decoupling service location and naming.

Microservices are a popular approach to SOAs [9, 35] adopted by many large-scale companies [15, 17]. Features of the back-end are handled by fine-grained services communicating through lightweight protocols, such as publish/subscribe or event stores [8]. The most common form of interaction between microservices is the use of point-to-point calls to Representational State Transfer (REST) APIs provided over HTTP.

We are interested in this work in the adaptation of microservices applications towards a joint deployment on core resources, e.g. in some cloud datacenter, and edge resources, e.g. at micro-clouds located in the same metropolitan-area network as the clients. Our objective is to reduce latencies between user actions and their visibility by other users.

We target collaborative editing applications based on microservices. We demonstrated in our previous work [25] that ShareLatex, an open source and microservices-based application for collaboratively editing \LaTeX documents, could benefit from reduced user-perceived latencies thanks to a *static* core/edge deployment of its microservices. This previous work considers however the placement of *entire* services onto different sites, which may lead to trading latency reduction for some users for latency increases for the others. It also does not consider the adaptation of this placement based on the actual location of the application users.

Contributions

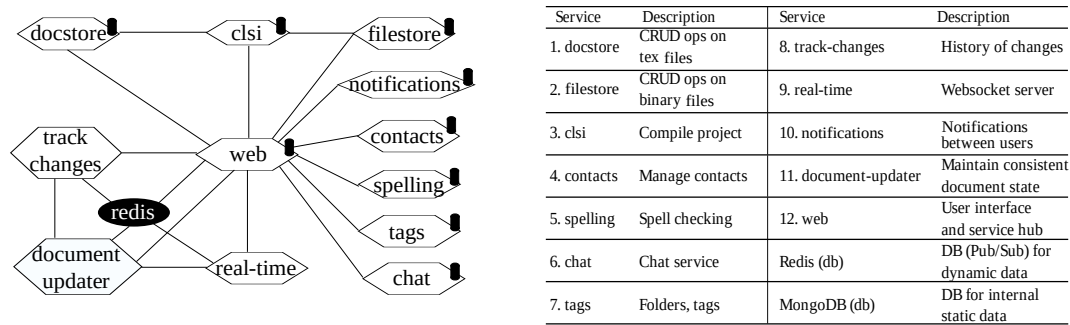
We consider in this paper the *dynamic* placement and migration of microservices in core/edge deployments. We leverage the use in modern microservices applications of resource-centric REST APIs and NoSQL databases partitioned by a single primary key. This allows us to *split* microservices, and create independent instances responsible for a partition of the original service's data. These splits, deployed at different edge locations, can then handle requests for specific partitions of the service data, accessed by close-by users. We demonstrate our ideas with ShareLatex (§2).

Our first contribution is the support for splitting and multi-site placement of microservices. We detail how the state of a microservice can be partitioned, and how the resulting splits can be dynamically deployed on different core and edge sites (§3).

Our second contribution is the middleware support for the decentralized and dynamic *discovery* of microservice splits. We build on Koala [26], a lightweight Distributed Hash Table (DHT) for decentralized cloud infrastructures. We enable the transparent redirection of calls based on resource identifiers present in HTTP Uniform Resource Identifiers (URIs), also supporting the *relocation* of microservices splits. This allows adapting compatible legacy microservices applications for hybrid core/edge deployments with minimal effort (§4).

Our third contribution is a locality-driven policy conducting the *creation* and *migration* of microservices splits between the core and the edge, and between edge sites themselves, allowing to seamlessly adapt to the location of the users. This policy estimates latencies using network coordinates [13], enabling the automatic selection of the most appropriate site for the services splits used by a group of collaborative users, with the goal of achieving better response times (§5).

We demonstrate our ideas on the ShareLatex application, using a representative core-edge



■ **Figure 1** ShareLatex architecture (left) and list of constituents (right).

network topology and measuring the impact of latencies at the level of the application front-end. Our results indicate that Koala and redirection layers induce only minimal overheads, while the dynamic placement of microservices splits enables users in different regions to access the same application with greatly reduced latencies (§6).

Finally, we present related work (§7) and conclude (§8).

2 ShareLatex and its core/edge deployment

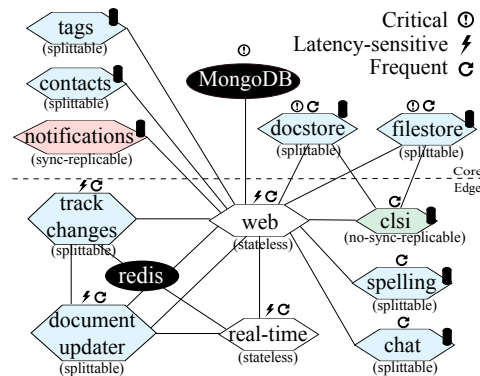
ShareLatex is a collaborative application allowing users (e.g. students, researchers or writers of technical documentation) to concurrently edit a \LaTeX project. It features a web-based editor with spellchecking and auto-completion, facilities for compiling and producing papers, and tools for the collaboration between writers, such as an address book and a chat service.

Responsiveness is a key element of the perceived quality of service in ShareLatex. For instance, a team of researchers could collaborate on the writing of algorithm pseudocode. Changes made by one researcher must be visible with no undue delay by the others, and changes must propagate as fast as possible to the reference document stored in the back-end to avoid concurrency hazards.

The ShareLatex back-end uses 12 microservices and a database, **Redis**, shared by four of them (Figure 1).¹ The **web** provides the front-end to the client browser and acts as an API gateway to other services. User actions (cursor changes, new text, etc.) are propagated by **web** to the **real-time** service using WebSockets. The **real-time** service then sends them to **document-updater** which is responsible for maintaining a consistent order of modifications. This dynamic state of the project is stored in **Redis**, and periodic snapshots are pushed to the **docstore** (text files) and **filestore** (binary files). Figure 1 details the ShareLatex architecture and its services.

Core servers are typically hosted in a centralized data center, while edge servers are distributed and closer to the users. In our previous work [25], we demonstrated that ShareLatex can benefit from a *static* placement of its services on a combination of core and edge servers, closer to clients collaborating on a document. We build on our previous contribution, which requires only minimalistic modifications to the configuration and deployment scripts of ShareLatex, and no changes to the application code. The most significant modification

¹ Note that using a shared database does not fully comply with the microservices architectural pattern, where all state should be encapsulated in services. Yet, such compromises with the norm are found in many microservices-based applications. We prefer taking them into account rather than heavily modifying the legacy application code.



■ **Figure 2** Static ShareLatex deployment as suggested in [25].

performed in our previous work is the disassembly of the **web** service implementation from its database. This was necessary as **web** acts as an API gateway and *must* be deployed at the edge, but it also features a global database of information about users, which is queried infrequently. These queries can be done remotely to a database in the core, with minimal performance penalty.

The static core and edge placement of services of Figure 2 follows the recommendations argued in our previous work [25]: **web**, **real-time**, **document-updater** and **Redis** should be deployed on an edge site. Due to the coupling of **track-changes** with **Redis**, this service must be deployed alongside to avoid remote calls, even if it does not influence perceived latencies as much. The **clsi**, **spelling** and **chat** services can also be deployed at the edge, with a moderate but positive impact on perceived latencies. This placement resulted in lower latencies for operations impacting the most the user experience, at the cost of increasing latencies for operations that require interactions between services at the edge and services remaining in the core.

3 Splitting microservices

While some microservices may be *stateless*, most of them need to internally store and query data. A stateful microservice is typically implemented as a business-logic tier combined with a database. The choice of the appropriate database is specific to each microservice, leading to what is sometimes called a *polyglot* architecture. Figure 1 represents the presence of a database inside each service using a small black database symbol. In the unmodified ShareLatex, only **real-time** is a stateless service. All other services are stateful, including **document-updater** and **track-changes** which use the common **Redis** database. With the decoupling of **web** from its database (as depicted in Figure 2), this service is also stateless and uses remote calls to a MongoDB service.

A key property of SOA and therefore of microservices is the ability to independently *scale in* and *out* the business-logic tier and the database [17]. For the former, new *instances* may be created and deleted *on the fly*, e.g. using deployment middleware such as Kubernetes [7] and a scaling policy [28]. Elastic scaling is difficult to realize with relational databases, and microservices state may grow to large sizes requiring the ability to scale out storage to a large number of servers. NoSQL options with such horizontal scaling abilities are therefore a favored choice in many microservices applications.

NoSQL databases such as key/value stores or document stores, partition the data using a unique primary key. We observe that very often, accesses to the database by the business-logic

tier for a query only read and write a *limited* and *identifiable* subset of keys. The identification of this subset typically depends on the characteristics of the query, and in particular on its *object*. It results that the state of the service, i.e. the content of the database, may be *partitioned* in such a way that keys that are accessed together for any future service requests belong to the same *partition*. This enables in turn the possibility to create multiple instances of the service, each equipped with one of the partitions. We call these services hosting independent partitions of the database *service splits*. A service that supports splitting is a *splittable* service.

Not all services are splittable. Some may require operations (e.g., Map/Reduce queries, scans, etc.) that operate on the entire content of the database. In some cases, it is not possible to identify a mapping between requests characteristics and partitions, e.g. when calls may use object keys generated at runtime or read from the database itself. These services are therefore only *replicable*: It is only possible to make *complete* copies of the service and its state. When these copies must be kept in sync for the well-functioning of the application, the service is *sync-replicable*. When operating on divergent copies does not impact, or impacts only marginally, the well-functioning of the application, provided that users systematically use the same copy, the service is *no-sync-replicable*.

The analysis of ShareLatex code results in the following categorization of services, also reflected in Figure 2.² The **notifications** service is *sync-replicable*, while **clsi**, handling the compilation, is *no-sync-replicable*: compilations across projects do not require consistent updates. The **web** service was initially *sync-replicable*, but the decoupling of its database makes it stateless. All other stateful services –a majority of them– are *splittable*. This means that their state (content of the services databases, but also the content of the shared **Redis** database) can be partitioned, and that partitions can be deterministically identified for any query. The object of the query, that allows identifying the partition of service state, and therefore the appropriate service split, is the specific writing *project* that the user is editing. In other words, the state of ShareLatex splittable services at the bottom of Figure 2 can be partitioned based on the project identifier, resulting in splits able to handle requests for a specific subset of projects. Such splits can then be deployed at the edge, and serve requests from close-by users accessing one of these projects.

The implementation of splitting requires support from the database embedded in splittable microservices, to be able to bulk load and store data partitions between an existing service and a newly created split. This support depends on the database API but does not pose implementation difficulties. For ShareLatex, we built minimalistic APIs enabling this for the **Redis** and **MongoDB** databases.

Our goal is to support the *dynamic* creation of service splits and their deployment over a combination of core and edge resources. This requires both appropriate *middleware support mechanisms* enabling the discovery and redirection of calls between microservices in a transparent manner, and appropriate *adaptation policies* to decide at runtime when and where to create splits, and when and where to migrate an existing split if its current location is not optimal. We cover these two aspects in the two following sections.

² This identification of services classes and partitions was performed manually, but did not represent a particularly difficult task in the case of ShareLatex. Automated or semi-automated service class identification and partitioning are beyond the scope of this paper, but we intend to explore these directions in our future work.

195 4 Discovering and redirecting to microservice splits

196 We now present the mechanisms that support the dynamic deployment of service splits on
 197 multiple sites. Our focus in this section is on the proper functioning of the system during
 198 and after service splitting and migration operations. We present the policies triggering these
 199 operations in the next section.

200 Our support middleware serves two purposes: Firstly, it enables the *discovery* of services
 201 and splits, and the live modification of their placement (§4.1). Secondly, it enables the
 202 *redirection* of point-to-point calls between source and destination services, ensuring that the
 203 core service or its appropriate split is reached (§4.2).

204 4.1 Discovery of microservice splits with Koala

205 Each service is initially associated with one instance in the core (the *core service*), responsible
 206 for its full state. Split and migrate operations dynamically update the list of splits for each
 207 service. Service discovery, therefore, requires the maintenance of an *index* of existing services,
 208 together with their current lists of splits. Every such split is associated with a list of object
 209 identifiers, for which this split is the only one able to process queries. This index must remain
 210 *strongly consistent*: At any point in time, there must be a single core service or split that can
 211 answer a query for a given object, and it must be impossible for two clients of the service
 212 under the same object to use different splits concurrently.

213 Service registries based on replicated databases updated using consensus (e.g., using
 214 etcd [11] or ZooKeeper [18]) are adapted for datacenter deployments with low network
 215 latencies. In our target context of distributed sites, centralizing the index would result in
 216 unacceptable overheads. We favor instead a decentralized design, supporting the caching
 217 and lazy revocation of split-to-site associations. This service is distributed, with an instance
 218 running at the core and at each of the edge sites.

219 Service discovery requests contain the name of the service, and for splittable services, the
 220 identifier of the query *object*. For ShareLatex splittable services, this object is the *project*
 221 *identifier*, that allows identifying the appropriate service state partition. Service discovery
 222 requests can be addressed to any of the sites.

223 The service index is implemented as a Distributed Hash Table (DHT), in which each
 224 node stores a subset of the index, partitioned using consistent hashing. Index elements are
 225 accessed using a primary key. Each node is responsible for a *range* of these keys. An overlay
 226 enables requests to deterministically reach the responsible node using greedy routing (each
 227 node in the path selects amongst the nodes it knows the closest to the destination). Typical
 228 DHT designs actively maintain all overlay links through the exchange of explicit overlay
 229 construction messages. In this work, we rely on Koala [27], a DHT that creates overlay links
 230 in a lazy manner, by piggybacking overlay construction messages over existing application
 231 traffic. This design choice enables to create more overlay links for routes in the overlay that
 232 are more frequently used for index reading requests, and minimize maintenance costs for
 233 seldom-used links. This is beneficial for workloads that are highly local, which is expected
 234 from service requests in one single application and to a relatively limited number of services
 235 (e.g. up to a few hundred).

236 Indexing

237 We keep two global indexes in Koala, an index of Objects, and an index of Splits. Figure 3
 238 shows an example of the local subset of these indexes maintained by one Koala node. A Koala

Object ID	Location	Responsibility	Split group
Object 1	local	YES	[Service 1 - Split 1, Service 2 - Split 1]
Object 2	local	6-8	[Service 1 - Split 1]
Object 3	5-2	YES	-

Service name	Split ID	Location	Responsibility	IP	Port
Service 1	Split 1	local	YES	x.x.25.1	3001
Service 2	Split 1	local	6-8	x.x.25.2	3002
Service 3	Split 1	9-7	YES		
Service 3	Split 2	5-2	YES		

■ **Figure 3** Indexes stored at some Koala DHT node: Objects table (left) and Splits table (right). Primary keys are in boldface.

node is *responsible* for maintaining the authoritative and strongly consistent entry for a number of index items, falling in its key responsibility range. It also maintains *local* resources, objects and splits, that are *hosted* on the corresponding edge site. A Koala node may have local resources for which it is not responsible or be responsible for resources that are not local. This design enables the creation of resources on a different node than the one that the DHT assigns for the corresponding entry index, while maintaining a single node in charge of this index entry and allowing atomic modifications. Lookups follow multiple hops in the overlay, until the *responsible* node is found, leading to one last hop to the node where the entry is *local* (if different). Nodes hosting locally a resource access it without involving the responsible node.

Discovery

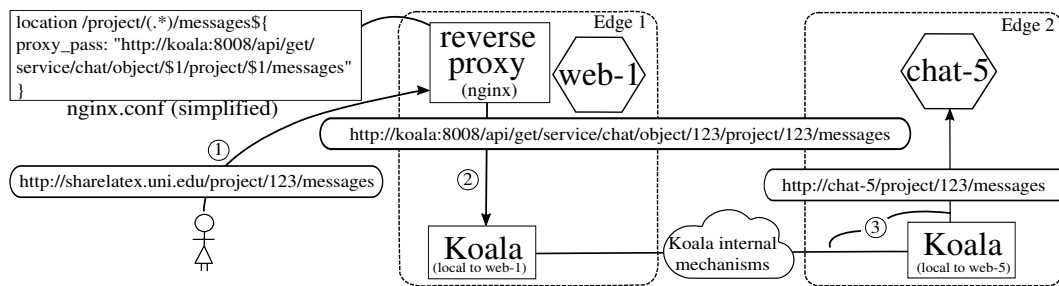
A local split can only be reached by proxying through the local Koala instance.³ The discovery of the appropriate site for an incoming service request proceeds in two phases. First, the Objects table in the DHT is queried to establish whether there exists a split of at least one service under that object. This information is stored in the *split group* for that object. If there is no entry for the object, or if there is no entry for the specific service in the split group, the request must go to the core. Second, the Koala node responsible for the split is located using the Splits table, using both the service name and split number as the key. This requires reaching the Koala node that is *responsible* for that key and then reaching the Koala node where that split is *local*.

For instance, on the node whose local subset of the index is represented by Figure 3, a request to Service 2 for Object 1 will be immediately sent to Service 2's Split 1 hosted locally. A request for Object 3 will be redirected in one hop to Koala node of identifier 5-2, to read its split group. A request for Object 4, not present in the local state, requires a multi-hop routing in the Koala overlay to request its service group.

Caching

Looking up service discovery entries in the DHT for *every* service call is too expensive. We implement *caching*: results of index lookup are kept at the local Koala node and reused. Stale cache entries are discarded in a lazy fashion. We leverage the fact that all requests must go through the *local* Koala node, e.g. on the edge site where the split actually runs. After the migration to a new site, queries based on stale cached information will arrive at the Koala node at the *previous* local location of the split. This node simply informs the origin, which invalidates related cache entries and falls back to a regular lookup.

³ Allowing uncontrolled connections from outside of the edge site might not be possible due to network constraints, or not desirable for security reasons. The local Koala node acts, therefore, as an API gateway for all local service splits.



■ **Figure 4** Example of REST call redirections in ShareLatex.

272 Migration

273 The *migration* of an existing split, or the creation of a new split, follows four phases. Firstly,
 274 an instance of the service is bootstrapped if none already exists at the destination edge site,
 275 or it is selected among existing instances, but it does not hold state or service requests.
 276 Secondly, a new entry in the Splits table is created to announce the existence of the new
 277 split. It does not contain a location yet. The split group for all corresponding objects is
 278 updated to indicate the temporary unavailability of the split. Service requests will block at
 279 the lookup request stage, and back off for a random time duration. Thirdly, the new instance
 280 receives the partition of the data from the source service or split. Finally, the Koala entry for
 281 the split is updated to reflect the location of the new *local* site for that split, and the split
 282 groups for all corresponding objects are updated. This allows request services to resume,
 283 using the new split location.

284 4.2 Transparent redirection of REST service calls

285 Modifying legacy microservices applications to directly make use of Koala APIs to discover
 286 and call services and splits would require an important effort. Instead, we leverage the
 287 fact that the objects of queries are accessible in the URIs of REST service calls. Indeed,
 288 REST being a resource-centric approach to designing interfaces, calls are made, typically
 289 over HTTP, to an explicit resource given in the request URI. We implement the transparent
 290 redirection of calls by extracting the object from this URI. Then, the local Koala node
 291 queries for the existence of a split for that object and the requested service. The request URI
 292 is transformed using rewriting rules to reach either the original core service, or the Koala
 293 node on the edge site where the split runs.

294 The implementation of the redirection is as follows. It is illustrated for a call in ShareLatex
 295 in Figure 4. We use the high-performance web server **nginx** as a reverse proxy for calls from,
 296 and to, local services. In ShareLatex, this includes the **web** service that serves as an API
 297 gateway for the user frontend. The reverse proxy translates the original request from the
 298 unmodified ShareLatex, to a request to the local Koala node. The discovery process detailed
 299 before establishes that there exists a split for that service that must serve the request. In the
 300 example of Figure 4, the **web** service on the Edge 1 site calls the **chat** service. The object
 301 “123”, the project identifier, is extracted from the call URI. Koala then determines that the
 302 service split is on the Edge 2 site. The request is redirected to **chat** service in that site,
 303 where the call is handled by Koala.

5 Splits creation and migration policy

The creation of service splits and their migration between sites obey an adaptation *policy*. This policy must determine *what* service to split, *when* these split decisions are made and *where* to (re)deploy the splits. Its goal is to ensure that user-perceived latencies in the application are minimized.

What service to split?

The first aspect of the policy is application-dependent and results from the analysis of the interactions between its microservices. A set of *splittable* services, and not necessarily all of them, must be tagged for a preferential deployment at the edge. This aspect of the ShareLatex policy builds upon our previous results [25] (§2). Microservices that lie in the bottom part of Figure 2 are tagged for edge deployment. All other services always remain in the core.

When should splits happen?

There are two situations where a split may be formed: When a new object is created, and when latencies to the core are too high. The first option is sufficient for the ShareLatex policy: The creation of a new project leads to the immediate creation of all corresponding splits.

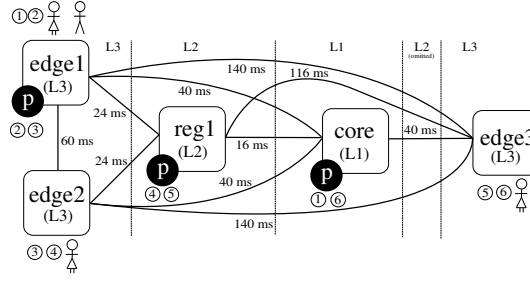
Where should splits go?

This aspect of the policy is twofold: Firstly, we must ensure that splits are created on a site (core or edge) close to the first user of the corresponding object. Secondly, we must adapt this placement when the chosen site is no longer the most adequate for the *current set* of users of that object.

This requires the ability to evaluate network latencies. Active probing of latencies (e.g. using ICMP packets) is impractical and unscalable. We combine two mechanisms to enable probe-less estimations. Firstly, we enforce that users always connect to the *geographically closest* site.⁴ The location of a client is that of its connection site. Secondly, latencies between sites are estimated using Network Coordinates (NCs). We use Vivaldi [13] to compute NCs. Each site is represented by a d -dimensional point. These points positions evolve following a process similar to a spring-mass relaxation, based on observed latencies for *actual* message exchanges, and Euclidean distances eventually approximate latencies.

The ShareLatex policy enforces that the initial version of an object, and the corresponding splits, be hosted by the connection site of the first user. Each site collects for its local splits, a history of the NCs of the sites forwarding client calls. Periodically (every 5 minutes, or 100 requests, whichever comes first, in our implementation), the policy determines whether migration of the splits for each hosted object is necessary. Several users access a project, from different sites and with different frequencies. The ideal location of the splits for that project can be represented as a point in the NCs space. We define this point as the Center of Mass (CoM) for that object. It is the geometric average of the connection sites' NCs, weighted by the number of accesses from their clients. If there exists a site whose NC is closer to the CoM, the policy triggers a migration of all splits for that object to this new site.

⁴ The list of core and edges sites IP is publicly known. Clients use an IP-to-location service (e.g. www.iplocation.net) and choose the geographically closest site.



■ **Figure 5** Topology and first experiment setup.

6 Evaluation

We evaluate the split and migrate principles with a full prototype, combining Koala, `nginx` reverse proxies, Docker CE for bootstrapping containers on the core and edge sites, and ShareLatex as the application.

Our evaluation aims at answering the following research questions: (i) Is the approach able to reduce perceived latencies for users of the application? (ii) Can the policy successfully migrate splits between edge sites when users' locations change? (iii) Is the overhead of using Koala and proxying acceptable?

We consider the three-layer (L1-L3) hierarchical topology shown in Figure 5. Its characteristics are derived from information obtained from an Internet Service Provider in the EU [23]. Layer L1 consists of the *core* site, L2 of regional sites (*reg1*) and L3 of edge sites (*edge1*, *edge2* and *edge3*). We deploy each site on a node of the Grid'5000 [5] testbed. Each node features 2 Intel Xeon E5-2630 v3 CPUs and 128GB of RAM. We emulate latencies between sites using the `tc` (traffic control) tool. Note that *reg1* is treated as an edge site, and that we ignore latencies between users and sites, and model their mobility by enforcing that they connect to a specific (closest) site. We use Network Coordinates (NCs) in $d = 2$ dimensions for ease of presentation, although a higher dimensionality (e.g. $d = 5$) would yield better estimations. Latencies are measured at the level of the instrumented ShareLatex frontend. We emulate the activity of users using the `Locust` [1] load testing tool, which allows describing programmatically the behavior of users as a list of actions and their respective occurrence frequencies.

6.1 Adaptation and split migrations for moving users

Our first experiment evaluates the ability of our approach to adapt the location of the splits for single a ShareLatex project, and the impact this has on latencies. We consider a project p shared by two equally active users, one stationary and one who changes her location continuously. Each user performs one operation every second, adding a new character to the text. The user-perceived latency is measured from the moment the text is updated by one user to the moment the update appears in the screen of the other user.

Figure 5 presents the experiment setup. Figure 6 presents the evolution of the average perceived latency for the two users, and Figure 7 presents the evolution of the CoM of the project. Circled numbers in all figures show the sequence of operations.

We follow three phases. In each phase, users are assigned to connection sites, and we observe the triggering and impact of the adaptation and resulting split migration decisions. Initially, both users are closer to *edge1* and therefore connect to that site. The latency for updating the text (50 ms) is roughly the RTT between *edge1* and *core*, plus the processing

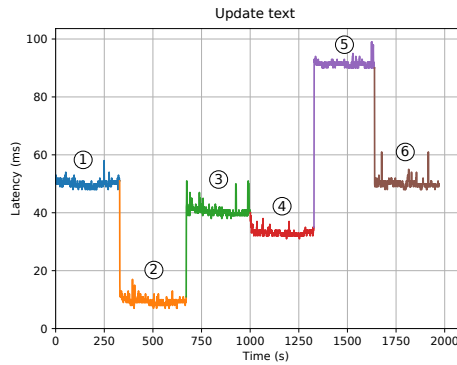


Figure 6 Evolution of *text update latencies* when migrating splits to follow a project CoM.

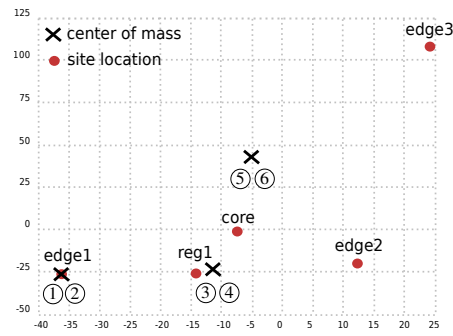


Figure 7 Evolution of Network Coordinates and CoMs when migrating splits.

Project	p1	p2	p3	p4	p5	p6	p7	p8	p9	p10
Users	u1, u5, u6	u2	u1, u3	u1, u4	u5, u6	u6	u4, u7	u5, u8, u9	u5, u8, u9	u8, u10
User locations	e1, e2, e2	e1	e1, e1	e1, e1	e2, e2	e2	e1, e2	e2, e3, e3	e2, e3, e3	e3, e3
Ideal site(s)	e2, r1, e1	e1	e1	e1	e2	e2	r1, e1, e2	e3, core, e2	e3, core, e2	e3

Table 1 Distribution of projects, users and ideal site placements.

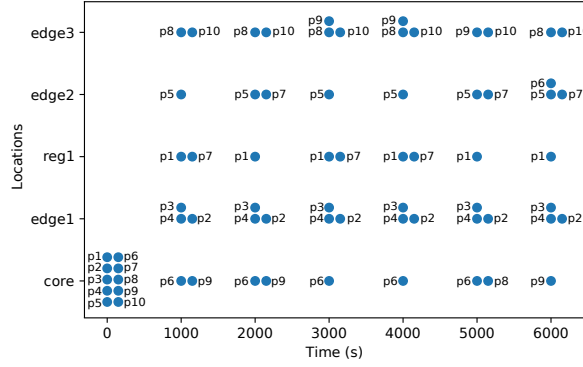
time, of 40 ms and 10 ms respectively (① in Figure 6). Given that all requests for project p originate from the Koala instance on *edge1*, that location is also the CoM (① in Figure 7), and therefore the policy decides to split and migrate all tagged services to this site (②). The latency drops to slightly over the processing time. In a second phase, we move one of the users to *edge2* while the service splits for the project are still in *edge1* (③). This results in an increase in latencies. When it next triggers, the adaptation policy decides to migrate the service splits to *reg1* which is closer to the new CoM for the project (④). In the third phase, we move the user of *edge2* and connect it to *edge3* (⑤). The service splits are still in *reg1*, which results in high latencies. Again, the adaptation policy triggers and orders the migration of splits to the closest site to the CoM (⑥). The *core* happens to be the best compromise to serve the two users connected to *edge1* and *edge3*. This experiment shows that the policy is effective in splitting and migrating a single project according to its user locations, for a positive impact on perceived latencies.

6.2 Evolution of splits distributions

This second experiment shows how the split and migrate principles allow shifting the load from the core servers to edge servers while following the location of the most active users in a *collection* of ShareLatex projects. All services are initially only in *core*. We consider 10 users and 10 projects. Each project is edited by 1, 2 or 3 users. The two first lines of Table 1 show the mapping between users and projects. The third line indicates the (static) user locations for each project.

We model the activity of users to represent work sessions. During one hour and a half, every user randomly picks one of their assigned projects and edits it for a random duration of 2 to 10 minutes. The project CoM evolves to follow the location(s) of the currently active user(s). The fourth line of Table 1 indicates the possible ideal location(s) for the project splits, calculated offline.

We monitor the location of the service splits for the different projects, taking snapshots



■ **Figure 8** Evolution of splits placements.

every 1,000 seconds. We run this experiment until the projects with a single ideal site placement reach this destination. Figure 8 presents these snapshots and the location of the service slices for the 10 projects. Projects whose ideal site is unique, such as *p2-p5* and *p10*, have the corresponding service slices migrated to these sites correctly and immediately. Projects with multiple ideal sites see their slices periodically migrate between these sites, following the currently active user(s). For instance, splits for *p7* move between *reg1* and *edge2*, while splits for *p8* and *p9* move between *edge3* and *core*. The final site is highlighted in boldface in Table 1. This experiment shows that the split and migrate mechanisms and the adaptation policy for ShareLatex allow dynamically moving microservices close to the users, based on the used resources (*projects* in ShareLatex).

6.3 Overheads of Koala and redirections

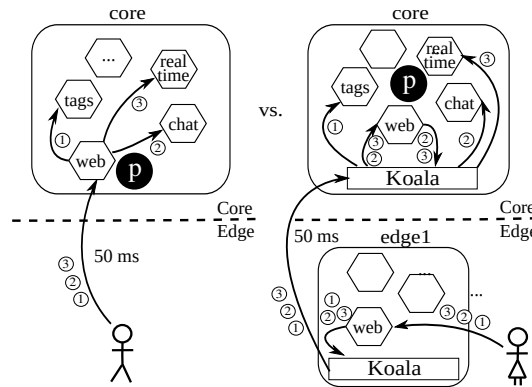
In this final experiment we evaluate the costs and overheads of the mechanisms enabling transparent call redirections. To isolate the overhead we compare a centralized setting where everything is deployed in the *core*, corresponding to the original ShareLatex model, with a one-edge-site setting where requests are redirected from this edge site to the core by Koala. Figure 9 presents this setup. We use a 50 ms latency between edge and core sites.

In both settings, the service split that responds to the user request is in *core*. In the centralized setting the request is first sent to the **web** core service and then forwarded to the right service directly, while in the second setting the request goes first through the local **web** split. This proxies the request to the Koala instance on *edge1*, which in turn forwards it to the Koala instance in *core* who then calls the service.

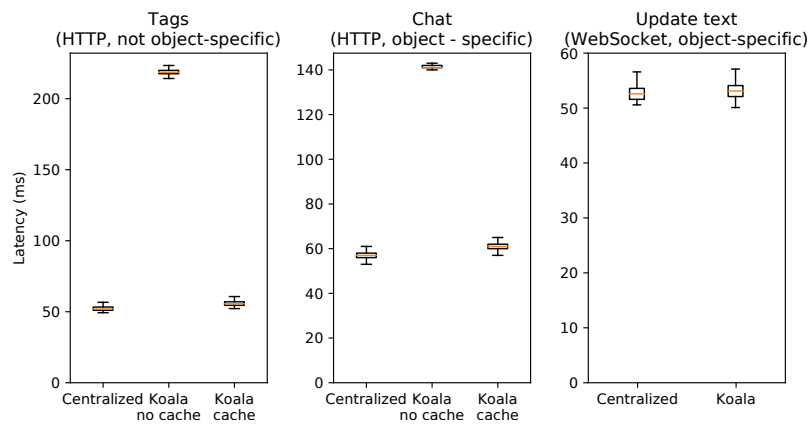
We distinguish three kinds of requests, two HTTP REST calls and one WebSocket request. For the REST calls, we consider a call to **tags**, for which splitting is disallowed (①), and a call to **chat**, which is splittable using the project identifier as the object (②). The WebSocket request updates the text (writing) ③. It is also a project-specific request and must reach the corresponding split of the **document-updater** service.

We expect a slightly higher overhead for redirections to split services compared to non-split ones. For non-split services, a single interaction with Koala is required (follow ①). For split services, two interactions are necessary: one to locate the object and one to redirect to the correct split (follow ② and ③).

The operation latencies times of the three requests with and without the redirection are shown in Figure 10. We consider two cases for the redirection: without and with caching. When the cache is disabled, lookups on the Koala DHT can require multiple hops between



■ **Figure 9** Setup for the experiment evaluating the overheads of Koala and redirections.



■ **Figure 10** Evaluation of the overheads of Koala and redirections.

sites and incur a significant and unpredictable penalty. With caching, this penalty is only paid for the first access or after a migration invalidates the cached information. WebSocket requests occur on an established connection, therefore caching does not apply.

Figure 10 presents the distribution of latencies for the three operations and for 500 requests each. We observe a similar performance between the centralized setting and the setup using caching. The median overhead of proxying through the local edge site is ≈ 3 ms for the non-split service and ≈ 4 ms for the split one. For WebSockets operations this difference is smaller, ≈ 1 ms, which can be explained by the fact that this protocol is more lightweight than HTTP. Disabling caching leads to significant overheads as every operation leads to lookups in the DHT, bouncing between the core and edge Koala instances. This experiment shows that the latency impact of proxying through the edge is likely to be negligible compared to the gain of using locally-deployed services splits.

7 Related work

Previous research advocates to revisit the SOA paradigm for supporting service-based applications deployed in edge cloud platforms [19]: In light of the increase of the number of services at the edge able to answer a specific query, service registration must take into account spatial coverage, and service discovery must take locality into account. Our contributions are a step in that direction.

The placement of applications on fog platforms has been an active research topic in the

recent years. One target domain is IoT applications where data collected from connected objects must be processed on nearby resources [24, 34]. Stream processing is another application that benefits from deployments on a combination of core and edge resources. It explicits its communication patterns (i.e., the directed acyclic graph linking stream processing operators), which can be leveraged for optimal placement on edge resources [12]. The Balanced RePartitioning (BRP) [4] algorithm targets generic distributed cloud applications and devises online algorithms which find a good trade-off between communication and migration costs.

Our work is linked with the concept of *mobile edge clouds*, where users move and connect to nearby resources dynamically [30]. When the mobility of users is modeled using Markov stochastic decision processes, analytical frameworks allow devising close-to-optimal algorithms for automating service placement [31]. Other approaches advocate the use of genetic algorithms to gradually refine an allocation of services to the edge [33].

We note that all of the aforementioned work considers the placement (and in some cases the migration) of *full* instances of services. We are not aware of solutions proposing to split stateful microservices and support resource-based discovery. State splitting is used, in a different context, for the elastic scaling of publish/subscribe middleware [6].

Research on collaborative edition has focused on enabling correctness and performance, including in the presence of network issues. The Jupiter protocol [21, 32] and the RGA protocol [22] implement a *replicated list object* abstraction and define how to propagate updates to achieve convergence [3]. Our work is complementary: The responsiveness of replicated list object algorithms (i.e. the time between an update and its visibility at the other clients) is sensitive to the latency between client nodes and a coordination server.

Service discovery middleware solutions for data centers typically rely on strongly consistent, fully replicated stores maintaining the complete index of services instances and of their locations. SmartStack [2], used for example by the Synapse [29] microservices platform, is based on Apache ZooKeeper [18]. Similarly to Koala, Synapse instances provide local proxies to services, but each maintains a full copy of the index while Koala relies on a DHT and caching for scalability. Kubernetes [10] leverages etcd [11] for service discovery. Recent work [14] suggests to add support for network coordinates [13] to route requests based on network locality. Yet, service selection decision remains a centralized process unlike with Koala where it can happen at the edge. Eureka [20] is also centralized but introduces the notion of *read clusters* that can serve requests closer to the clients. Unlike lazy cache management in Koala, read clusters must be explicitly synchronized when the service index changes. *Write clusters* can also be replicated, but are only eventually consistent, which makes them ill-suited for implementing consistent service migration. Finally, Consul [16] supports deployment to multiple data centers, and use network coordinates for location-aware selection. Consul only uses consensus-based synchronization within each individual data center. Updates propagate lazily between data centers using gossip, preventing consistent service relocation *across* data centers.

8 Conclusion

We presented how microservices could be dynamically deployed on a combination of core and edge resources. Our approach leverages the possibility to *split* microservices for which partitions of the data can be used to answer subsets of service requests independently. The Koala middleware enables to transparently redirect requests to the appropriate split based on object information available in REST calls URIs. Migration policies enable a dynamic placement of microservices splits on edge sites, and as our evaluation with the ShareLatex application shows, allow following the users and reduce perceived latencies.

This work opens interesting perspectives that we intend to consider in our future work. First, we wish to explore the automation of the identification of splittable microservices, and the use of static and dynamic analysis techniques to infer the relation between objects and state partitions. Second, we intend to extend support middleware to support redirections with other forms of communication, such as publish/subscribe or event sourcing [8]. Finally, we would like to build tools to automatize the identification of placement policies based on dynamic observations of communications between microservices.

Acknowledgments

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References

- 1 Locust: An open source load testing tool. <https://www.locust.io>.
- 2 Airbnb. SmartStack Service Discovery in the Cloud. <https://bit.ly/2SAvRHn>.
- 3 Hagit Attiya, Sebastian Burckhardt, Alexey Gotsman, Adam Morrison, Hongseok Yang, and Marek Zawirski. Specification and complexity of collaborative text editing. In *ACM Symposium on Principles of Distributed Computing*, PODC. ACM, 2016.
- 4 Chen Avin, Andreas Loukas, Maciej Pacut, and Stefan Schmid. Online balanced repartitioning. In *International Symposium on Distributed Computing*, DISC. Springer, 2016.
- 5 Daniel Balouek, Alexandra Carpen Amarie, Ghislain Charrier, Frédéric Desprez, Emmanuel Jeannot, Emmanuel Jeanvoine, Adrien Lèbre, David Margery, Nicolas Niclausse, Lucas Nussbaum, Olivier Richard, Christian Pérez, Flavien Quesnel, Cyril Rohr, and Luc Sarzyniec. Adding virtualization capabilities to the Grid’5000 testbed. In *Cloud Computing and Services Science*, volume 367 of *Communications in Computer and Information Science*. Springer, 2013.
- 6 Raphaël Barazzutti, Thomas Heinze, André Martin, Emanuel Onica, Pascal Felber, Christof Fetzer, Zbigniew Jerzak, Marcelo Pasin, and Etienne Rivière. Elastic scaling of a high-throughput content-based publish/subscribe engine. In *34th International Conference on Distributed Computing Systems*, ICDCS. IEEE, 2014.
- 7 David Bernstein. Containers and cloud: From LXC to Docker to Kubernetes. *IEEE Cloud Computing*, 1(3):81–84, 2014.
- 8 Dominic Betts, Julian Dominguez, Grigori Melnik, Fernando Simonazzi, and Mani Subramanian. *Exploring CQRS and Event Sourcing: A journey into high scalability, availability, and maintainability with Windows Azure*. Microsoft patterns & practices, 2013.
- 9 Fabienne Boyer, Xavier Etchevers, Noël De Palma, and Xinxu Tao. Architecture-based automated updates of distributed microservices. In *International Conference on Service-Oriented Computing*, ICSOC. Springer, 2018.
- 10 Cloud Native Computing Foundation. Kubernetes. <https://kubernetes.io/>.
- 11 CoreOS. Etcd reliable key-value store. <https://coreos.com/etcd/>.
- 12 Alexandre da Silva Veith, Marcos Dias de Assuncao, and Laurent Lefevre. Latency-aware placement of data stream analytics on edge computing. In *International Conference on Service-Oriented Computing*, ICSOC. Springer, 2018.
- 13 Frank Dabek, Russ Cox, Frans Kaashoek, and Robert Morris. Vivaldi: A decentralized network coordinate system. In *ACM SIGCOMM Computer Communication Review*, volume 34, 2004.
- 14 Ali Fahs and Guillaume Pierre. Proximity-aware traffic routing in distributed fog computing platforms. In *IEEE/ACM International Symposium in Cluster, Cloud, and Grid Computing*, CCGrid, 2019.
- 15 Yu Gan, Yanqi Zhang, Dailun Cheng, Ankitha Shetty, Priyal Rathi, Nayan Katarki, Ariana Bruno, Justin Hu, Brian Ritchken, Brendon Jackson, et al. An open-source benchmark suite for microservices and their hardware-software implications for cloud & edge systems. In *24th*

- 553 *International Conference on Architectural Support for Programming Languages and Operating*
 554 *Systems*, ASPLOS. ACM, 2019.
- 555 16 HashiCorp. Consul. <https://www.consul.io/>.
- 556 17 Wilhelm Hasselbring and Guido Steinacker. Microservice architectures for scalability, agility
 557 and reliability in e-commerce. In *Workshops of the Intl. Conf. on Software Architecture*, ICSA
 558 Workshops. IEEE, 2017.
- 559 18 Patrick Hunt, Mahadev Konar, Flavio P. Junqueira, and Benjamin Reed. Zookeeper: Wait-free
 560 coordination for internet-scale systems. In *USENIX Annual Technical Conference*, ATC, 2010.
- 561 19 Valérie Issarny, Georgios Bouloukakis, Nikolaos Georgantas, and Benjamin Billet. Revisiting
 562 service-oriented architecture for the IoT: a middleware perspective. In *International Conference*
 563 *on Service-Oriented Computing*, ICSOC. Springer, 2016.
- 564 20 Netflix. Eureka 2.0. <https://bit.ly/2Mcexda>.
- 565 21 David A Nichols, Pavel Curtis, Michael Dixon, John Lamping, et al. High-latency, low-
 566 bandwidth windowing in the jupiter collaboration system. In *ACM Symposium on User*
 567 *Interface Software and Technology*, 1995.
- 568 22 Hyun-Gul Roh, Myeongjae Jeon, Jin-Soo Kim, and Joonwon Lee. Replicated abstract data
 569 types: Building blocks for collaborative applications. *Journal of Parallel and Distributed*
 570 *Computing*, 71(3):354–368, 2011.
- 571 23 Sanhaji A. (Orange Labs Networks, France). Private communication, 2019.
- 572 24 Olena Skarlat, Matteo Nardelli, Stefan Schulte, Michael Borkowski, and Philipp Leitner.
 573 Optimized iot service placement in the fog. *Service Oriented Computing and Applications*,
 574 11(4), 2017.
- 575 25 Genc Tato, Marin Bertier, Etienne Rivière, and Cédric Tedeschi. Sharelatex on the edge:
 576 Evaluation of the hybrid core/edge deployment of a microservices-based application. In *3rd*
 577 *Workshop on Middleware for Edge Clouds & Cloudlets*, MECC. ACM, 2018.
- 578 26 Genc Tato, Marin Bertier, and Cédric Tedeschi. Designing overlay networks for decentralized
 579 clouds. In *Int. Conf. on Cloud Computing Technology and Science*, CloudCom. IEEE, 2017.
- 580 27 Genc Tato, Marin Bertier, and Cédric Tedeschi. Koala: Towards lazy and locality-aware
 581 overlays for decentralized clouds. In *2nd IEEE International Conference on Fog and Edge*
 582 *Computing*, ICFEC, 2018.
- 583 28 Giovanni Toffetti, Sandro Brunner, Martin Blöchliger, Florian Dudouet, and Andrew Ed-
 584 monds. An architecture for self-managing microservices. In *AIMC Workshop*. ACM, 2015.
- 585 29 Nicolas Viennot, Mathias Lécuyer, Jonathan Bell, Roxana Geambasu, and Jason Nieh. Synapse:
 586 A microservices architecture for heterogeneous-database web applications. In *10th European*
 587 *Conference on Computer Systems*, ACM EuroSys, 2015.
- 588 30 Shiqiang Wang, Rahul Urgaonkar, Ting He, Kevin Chan, Murtaza Zafer, and Kin K Leung.
 589 Dynamic service placement for mobile micro-clouds with predicted future costs. *IEEE*
 590 *Transactions on Parallel and Distributed Systems*, 28(4), 2016.
- 591 31 Shiqiang Wang, Rahul Urgaonkar, Murtaza Zafer, Ting He, Kevin Chan, and Kin K Leung.
 592 Dynamic service migration in mobile edge-clouds. In *IFIP Networking Conference*, 2015.
- 593 32 Hengfeng Wei, Yu Huang, and Jian Lu. Specification and Implementation of Replicated List:
 594 The Jupiter Protocol Revisited. In *22nd International Conference on Principles of Distributed*
 595 *Systems*, OPODIS, Leibniz International Proceedings in Informatics (LIPIcs), 2018.
- 596 33 Hongyue Wu, Shuiguang Deng, Wei Li, Min Fu, Jianwei Yin, and Albert Y Zomaya. Service
 597 selection for composition in mobile edge computing systems. In *International Conference on*
 598 *Web Services*, ICWS. IEEE, 2018.
- 599 34 Ye Xia, Xavier Etchevers, Loic Letondeur, Adrien Lebre, Thierry Coupaye, and Frédéric
 600 Desprez. Combining heuristics to optimize and scale the placement of iot applications in the
 601 fog. In *IEEE/ACM 11th Int. Conf. on Utility and Cloud Computing*, UCC, 2018.
- 602 35 Uwe Zdun, Elena Navarro, and Frank Leymann. Ensuring and assessing architecture confor-
 603 mance to microservice decomposition patterns. In *International Conference on Service-Oriented*
 604 *Computing*, ICSOC. Springer, 2017.